

# The “Deep Blue” aerosol project at NASA GSFC

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<https://deepblue.gsfc.nasa.gov/>



# ! Aerosols:

- " What, why, and how?

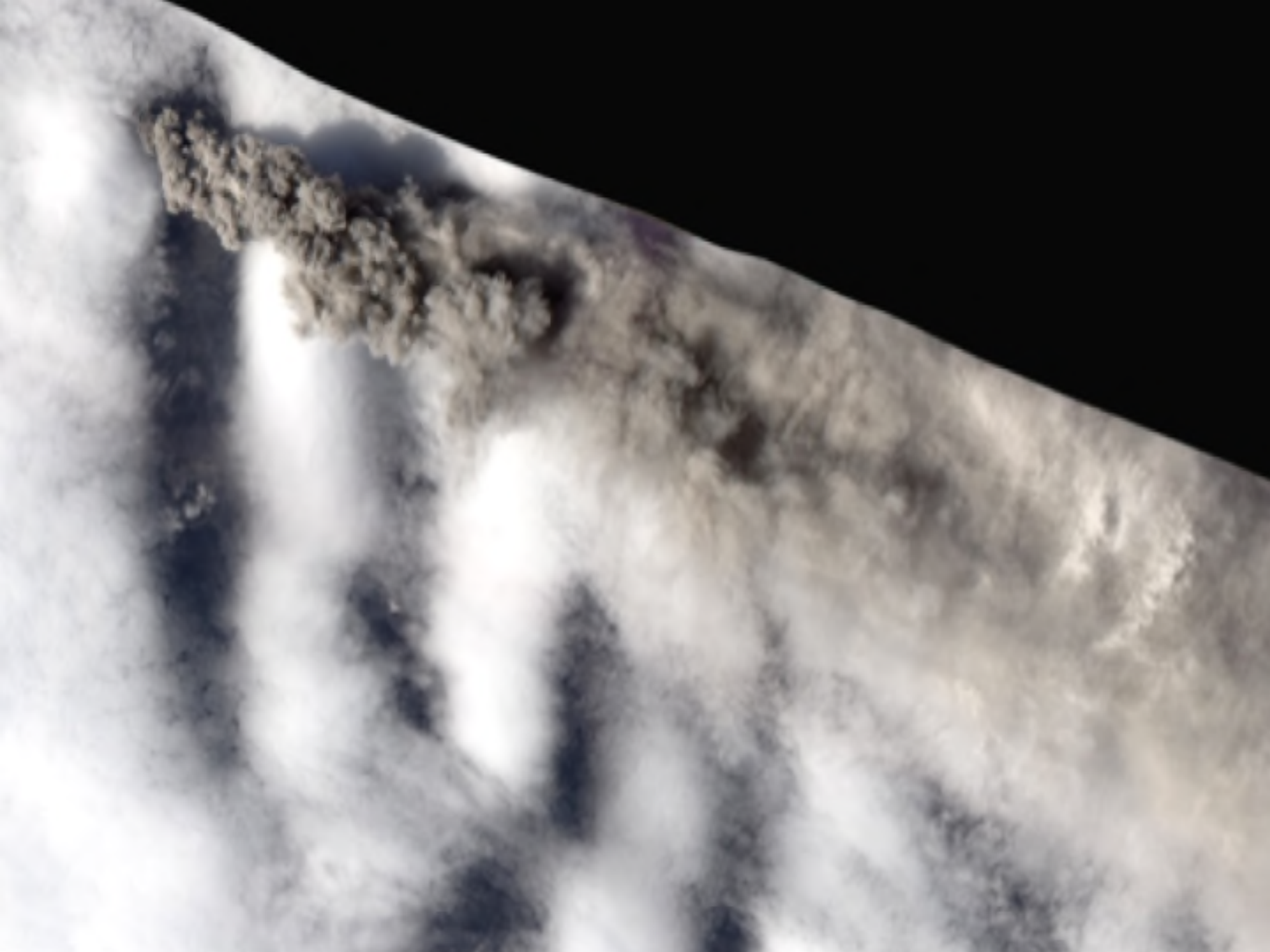
- " The Deep Blue aerosol data sets

# ! Current challenges and new directions

- " Calibration

- " Aerosols above clouds

# Aerosols















# Satellites give us the big picture

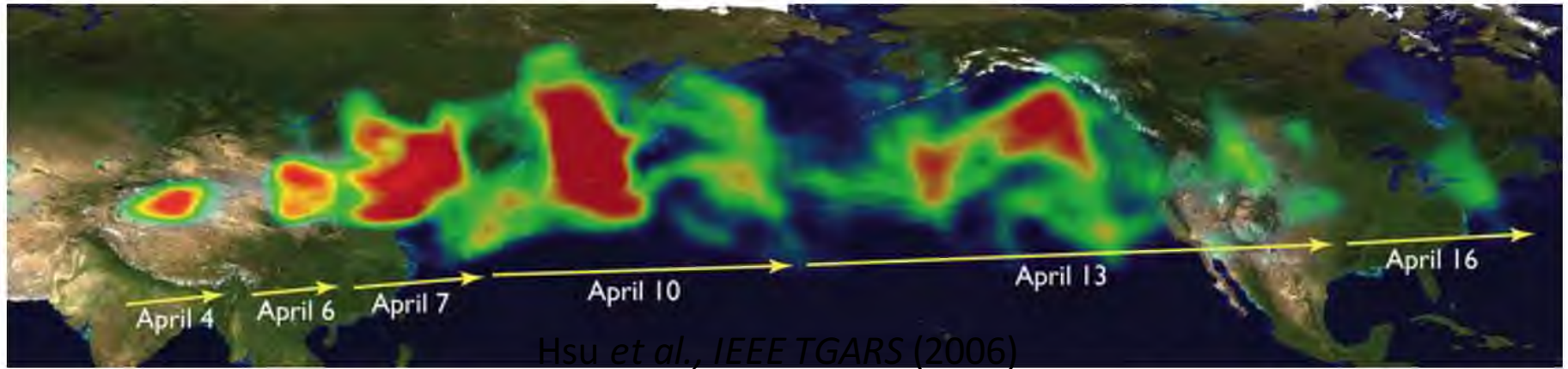
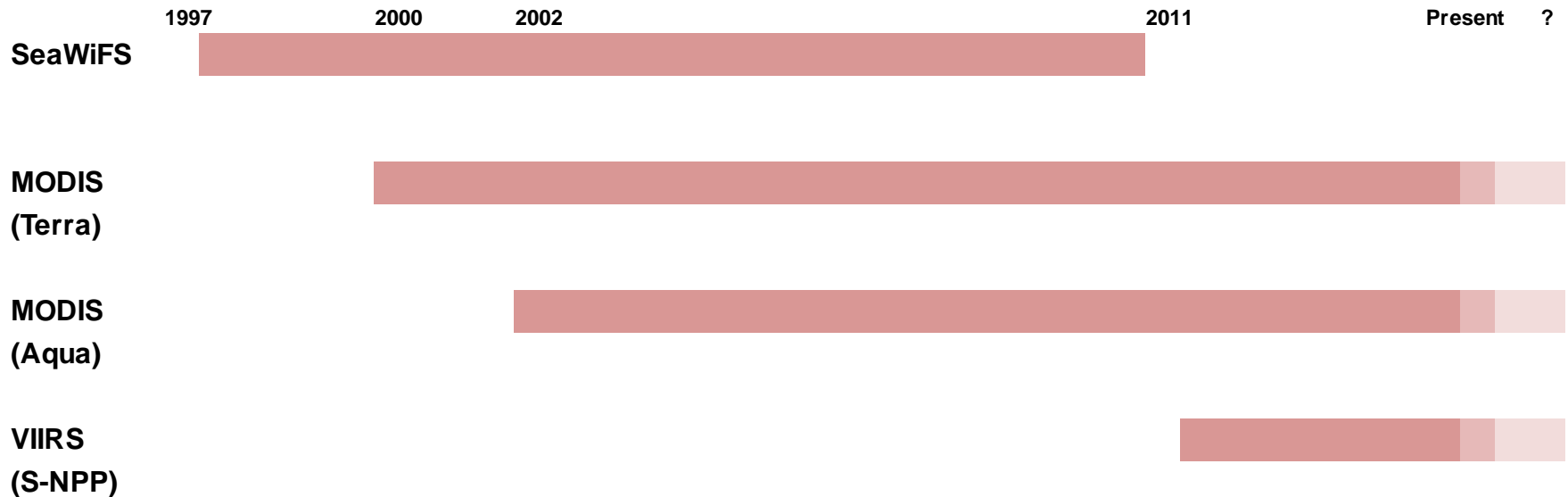


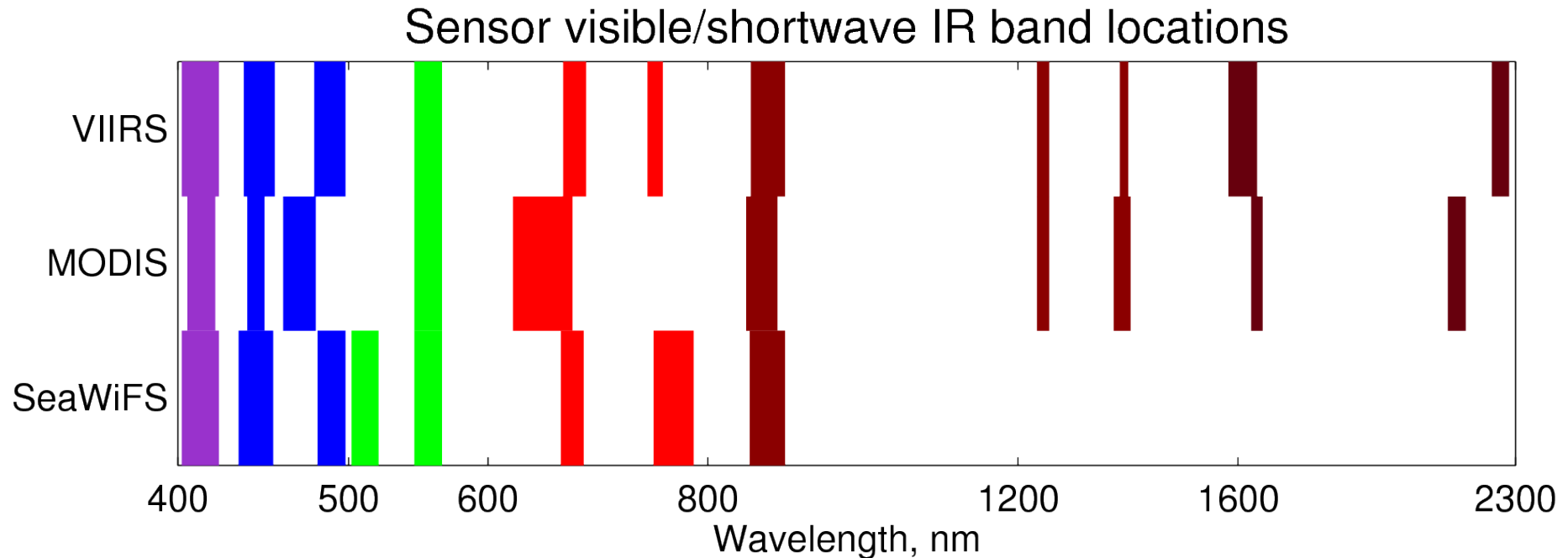
Fig. 1. Time series of TOMS AI composite in April 2001 showing the long-range transport of Asian dust across the Pacific reaching as far as the east coast of the U.S.

Hsu et al., IEEE TGARS (2006)

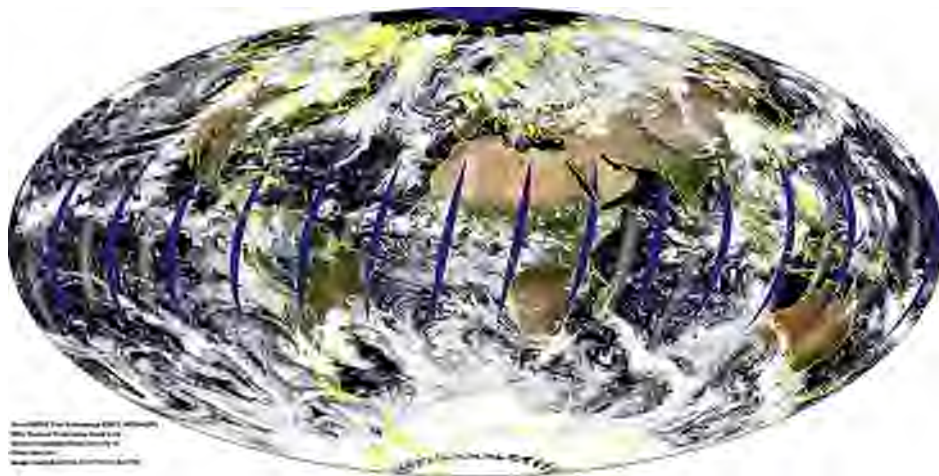
# Using multiple similar satellite sensors helps to create a consistent long data record



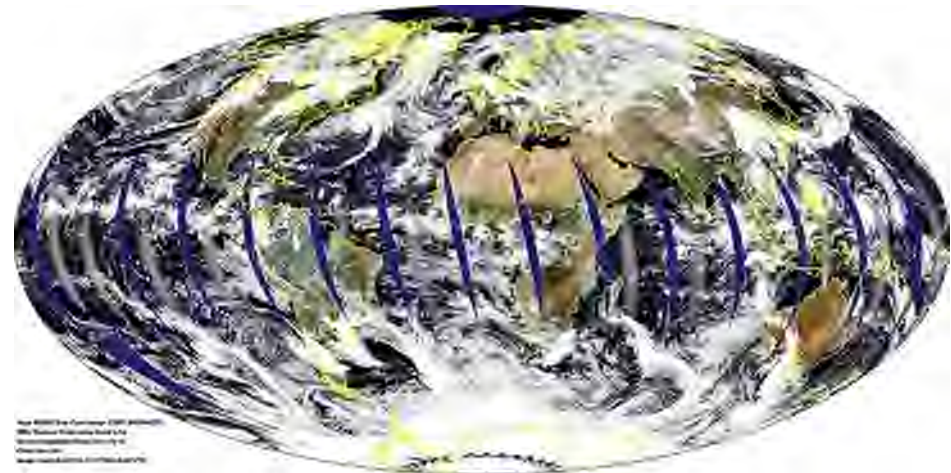
# Using multiple similar satellite sensors helps to create a consistent long data record



# Using multiple similar satellite sensors helps to create a consistent long data record



MODIS Terra  
10:30 am/pm local solar Equatorial crossing time



MODIS Aqua  
1:30 am/pm local solar Equatorial crossing time

- ! Level 1 pixel sizes ~ 1 km or finer
- ! Level 2 pixel sizes ~ 5-15 km
- ! Daytime revisit ~ daily

# Satellite aerosol remote sensing is a complex, underconstrained problem

$$TOA = \underbrace{ATM}_{\text{Atmosphere}} + \frac{\underbrace{T}_{\text{Surface}} \underbrace{T}_{\text{Surface}}}{1 + \underbrace{DIF}_{\text{Surface}} \underbrace{S}_{\text{Surface}}}$$

The diagram illustrates the equation for Top of Atmosphere (TOA) radiance. The first term,  $ATM$ , is enclosed in a blue oval. The second term is a fraction with a denominator of 1. The numerator consists of two overlapping blue ovals, each containing the letter  $T$ , with their intersection shaded in red and labeled  $S$ . The denominator consists of two overlapping blue ovals, each containing the word  $DIF$ , with their intersection shaded in red and labeled  $S$ . The red shading and labels indicate that the surface reflectance  $S$  is a common factor in both the numerator and denominator terms.

## ! Atmosphere

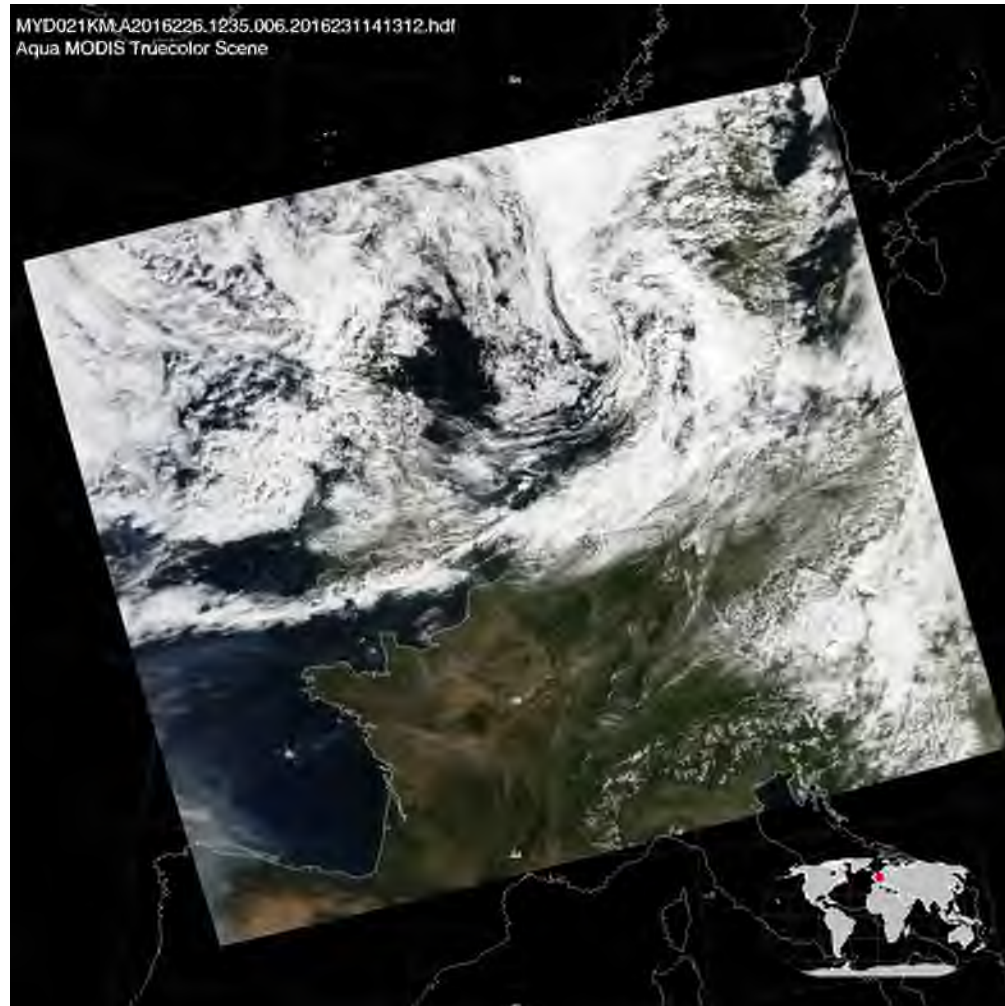
- " Aerosols
- " Trace gases
- " Molecular (Rayleigh) scattering

## ! Surface reflectance

- ! All have spectral and directional dependence
- ! Need additional constraints as input beyond the satellite observations



The aerosol signal is often small,  
and we cannot see through clouds



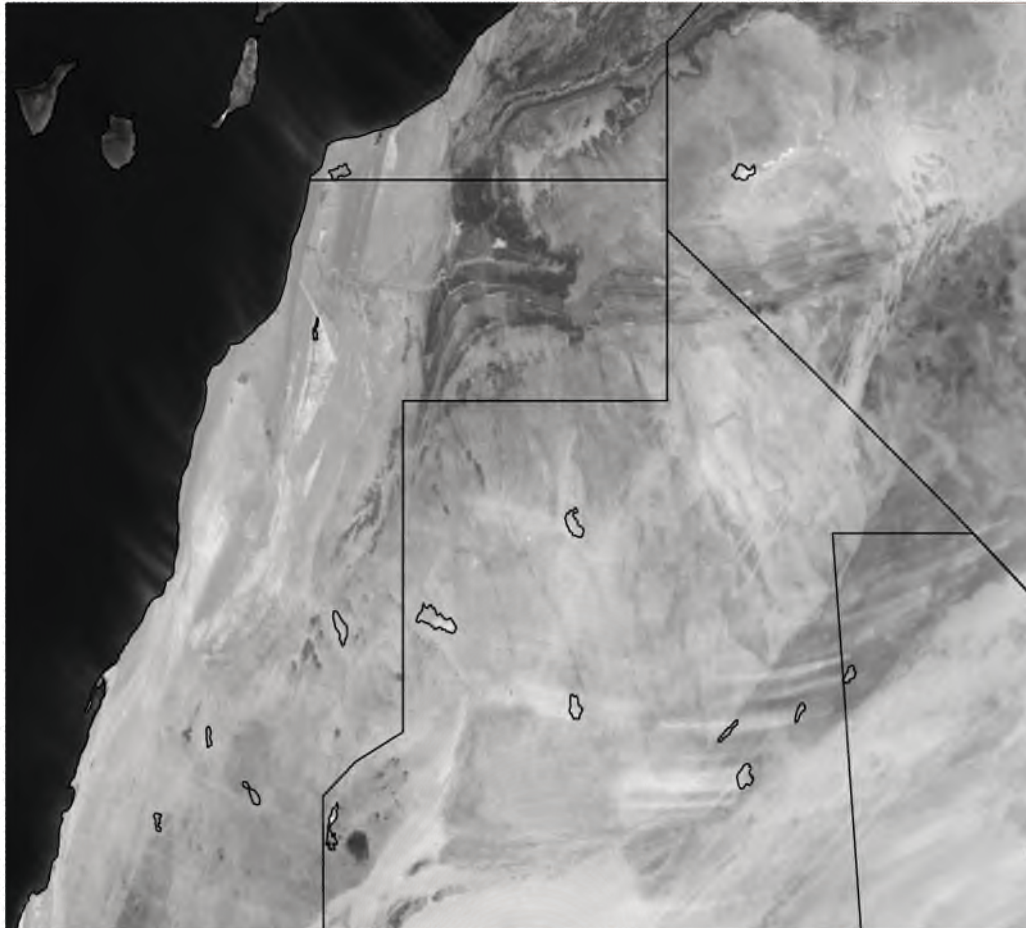
# Surface cover changes through time, often rapidly



NASA Earth Observatory, <http://earthobservatory.nasa.gov/Features/Aerosols/>

Blue spectral bands offer high contrast  
between surface and atmospheric features

MODIS Terra (Orbit File) Reference UTC



The main quantity we determine from space is aerosol optical depth (AOD,  $\tau$ )

$$\tau = \int_0^{\infty} \omega_0(z) \tau_{\text{ext}}(z) dz$$

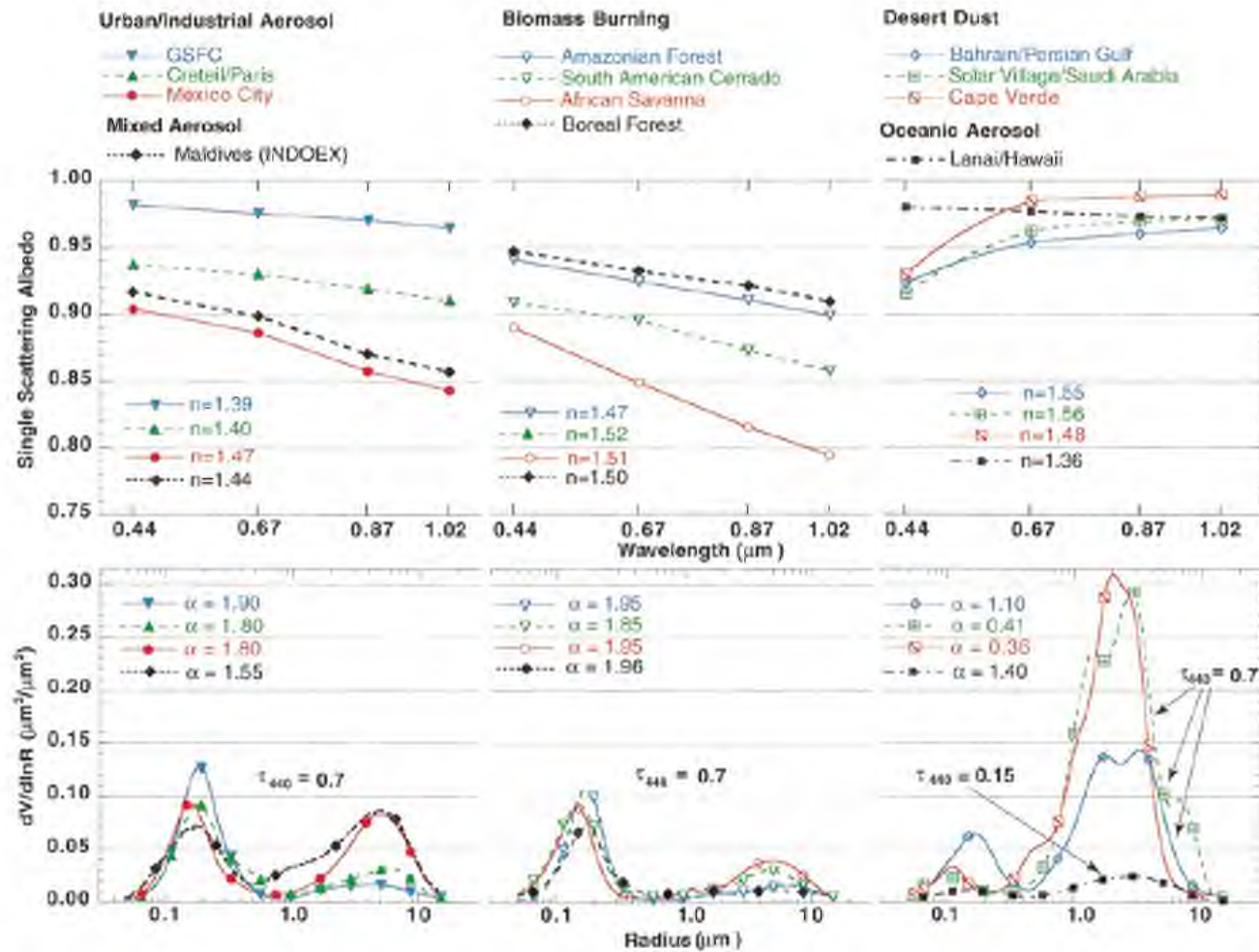
$$\omega_0 = \frac{\tau_{\text{sca}}}{\tau_{\text{sca}} + \tau_{\text{abs}}}$$

$$\tau_{\text{ext}} = \frac{d \log(I_0 / I)}{dz} = \frac{d \log(I_0 / I)}{d \log(I_0 / I)} \frac{d \log(I_0 / I)}{dz}$$

Ångström exponent (AE,  $\alpha$ )



# Aerosol scattering and absorption can be modeled using size distribution, shape, and refractive index



Dubovik *et al.*, JAS (2002)



# The Deep Blue family consists of three separate AOD retrieval algorithms

## Bright land

Surface reflectance database, BRDF correction

AOD retrieved separately at each of 412, 470/490, (650) nm  
SSA retrieved for heavy dust events

## Dark land

Spectral/directional surface reflectance relationship

AOD retrieved separately at 470/490 and 650 nm

## Water

Surface BRDF including glint, foam, underlight

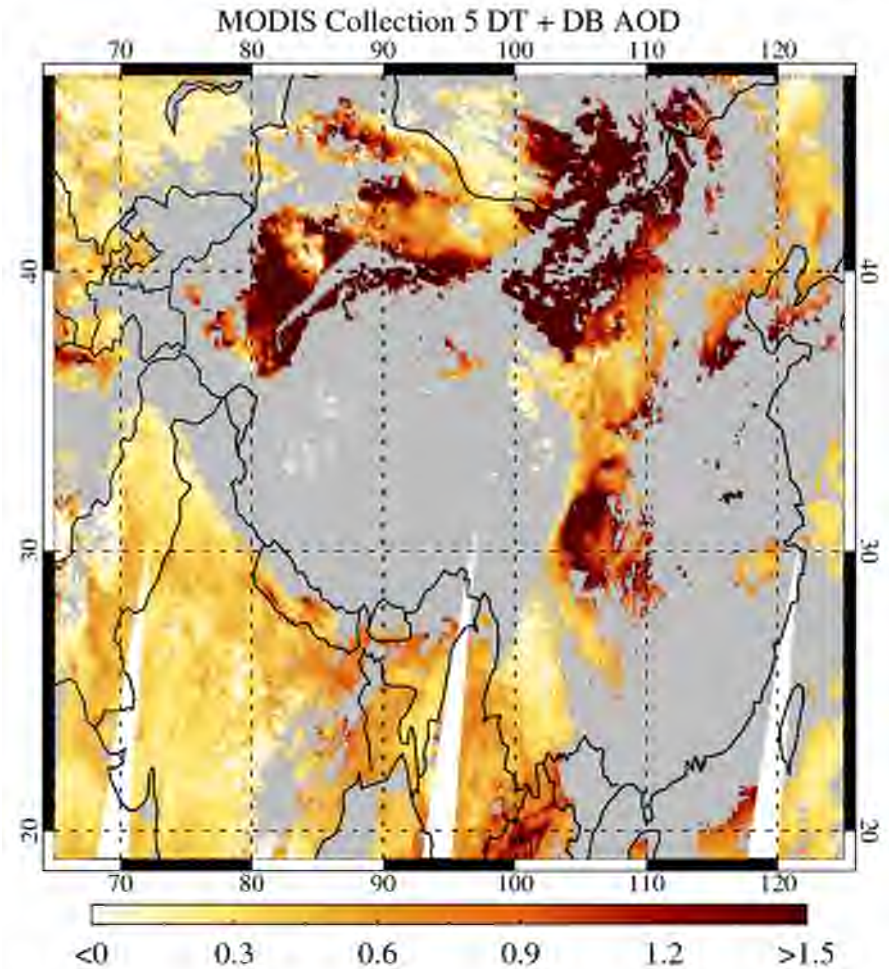
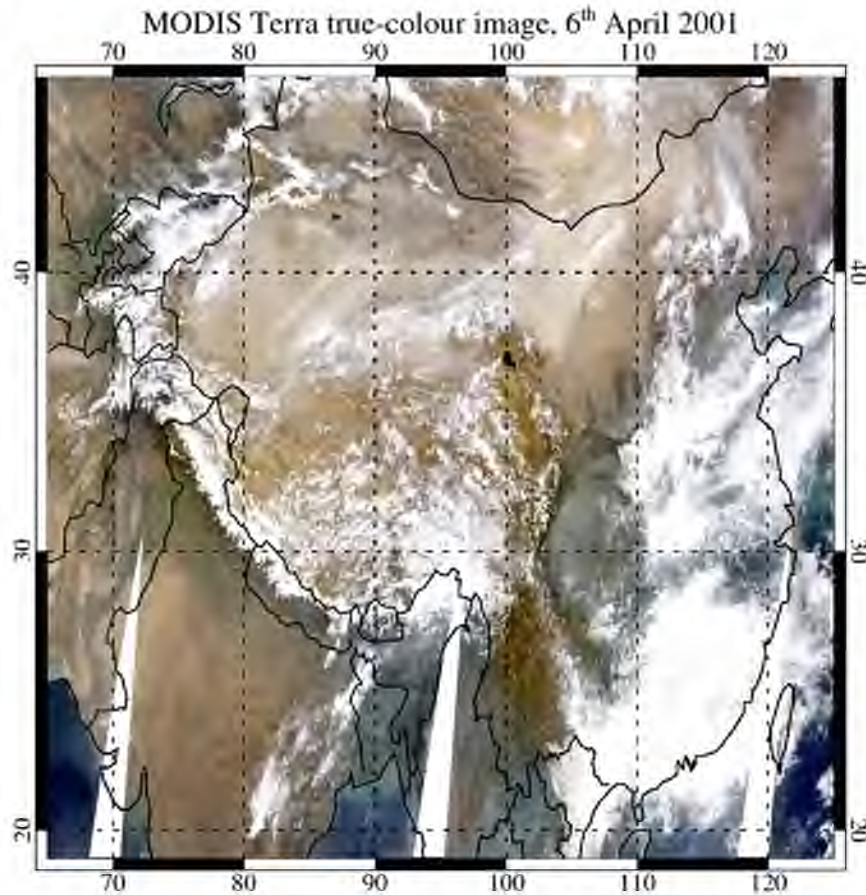
Multispectral inversion

*(Not present in MODIS dataset)*

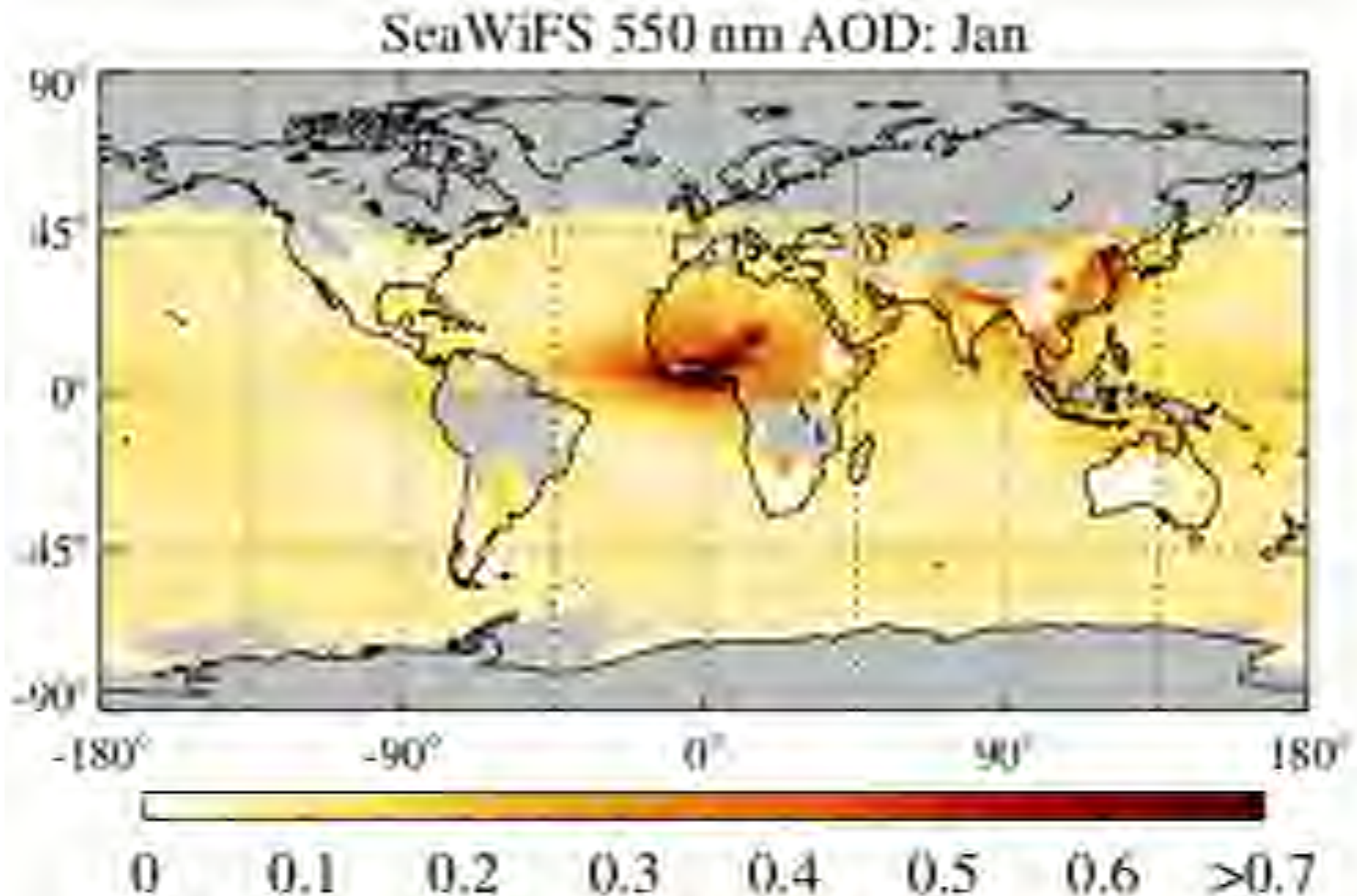


All report the AOD at 550 nm, and Ångström exponent (AE)

# Deep Blue's initial contribution was to expand AOD coverage to bright surfaces



Coverage is near-global;  
clouds, snow, and polar night are unavoidable





# Sun photometers provide our main validation data source



Hand-held Microtops Sun photometer  
(credit B. Howl)



CIMEL CE-318 Sun photometer  
(credit T. Yasunari, Hokkaido University, Japan)

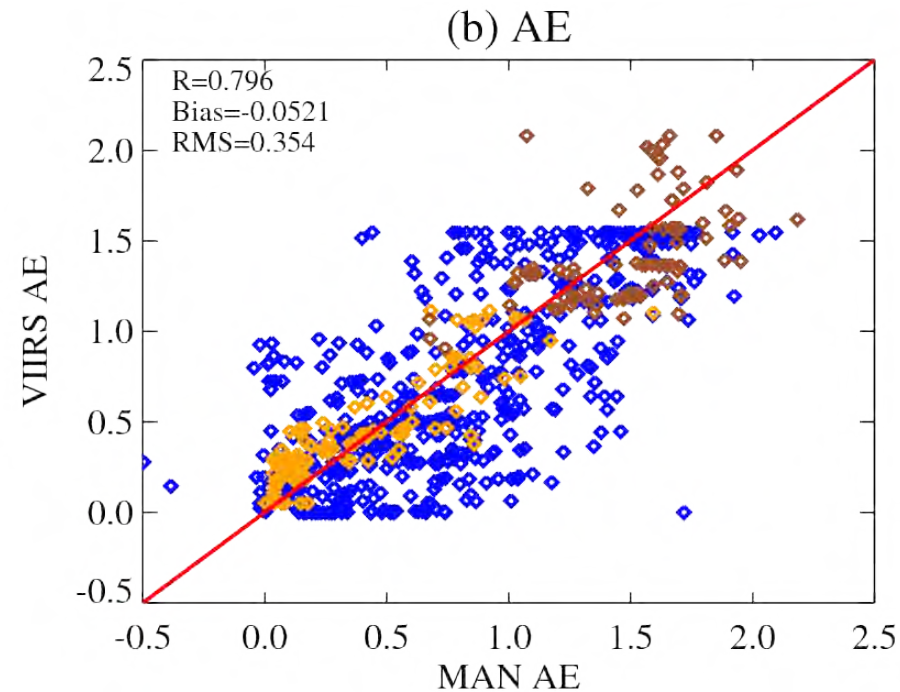
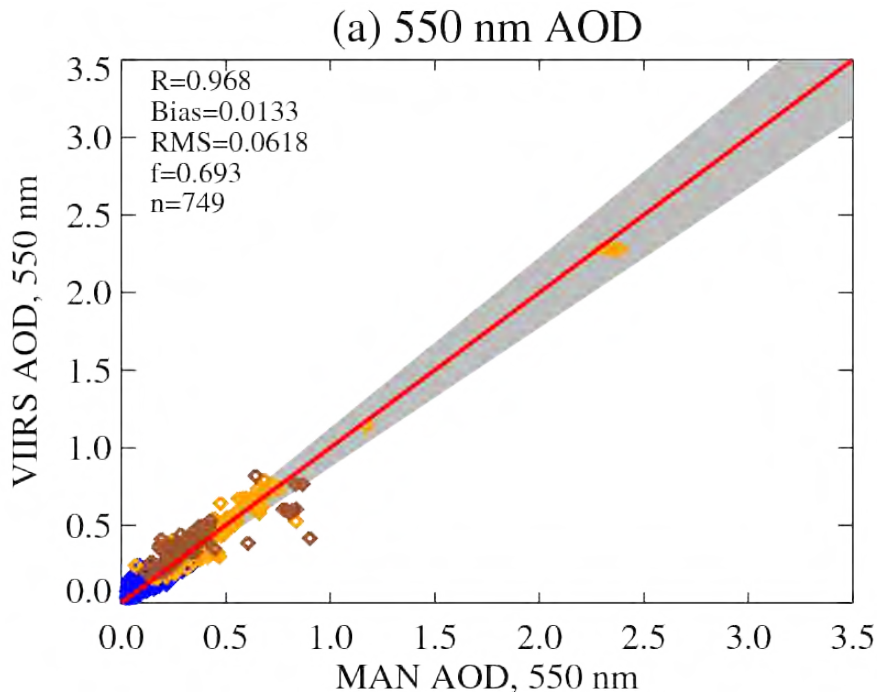
# Sun photometers provide our main validation data source



AERONET, [aeronet.gsfc.nasa.gov](http://aeronet.gsfc.nasa.gov)

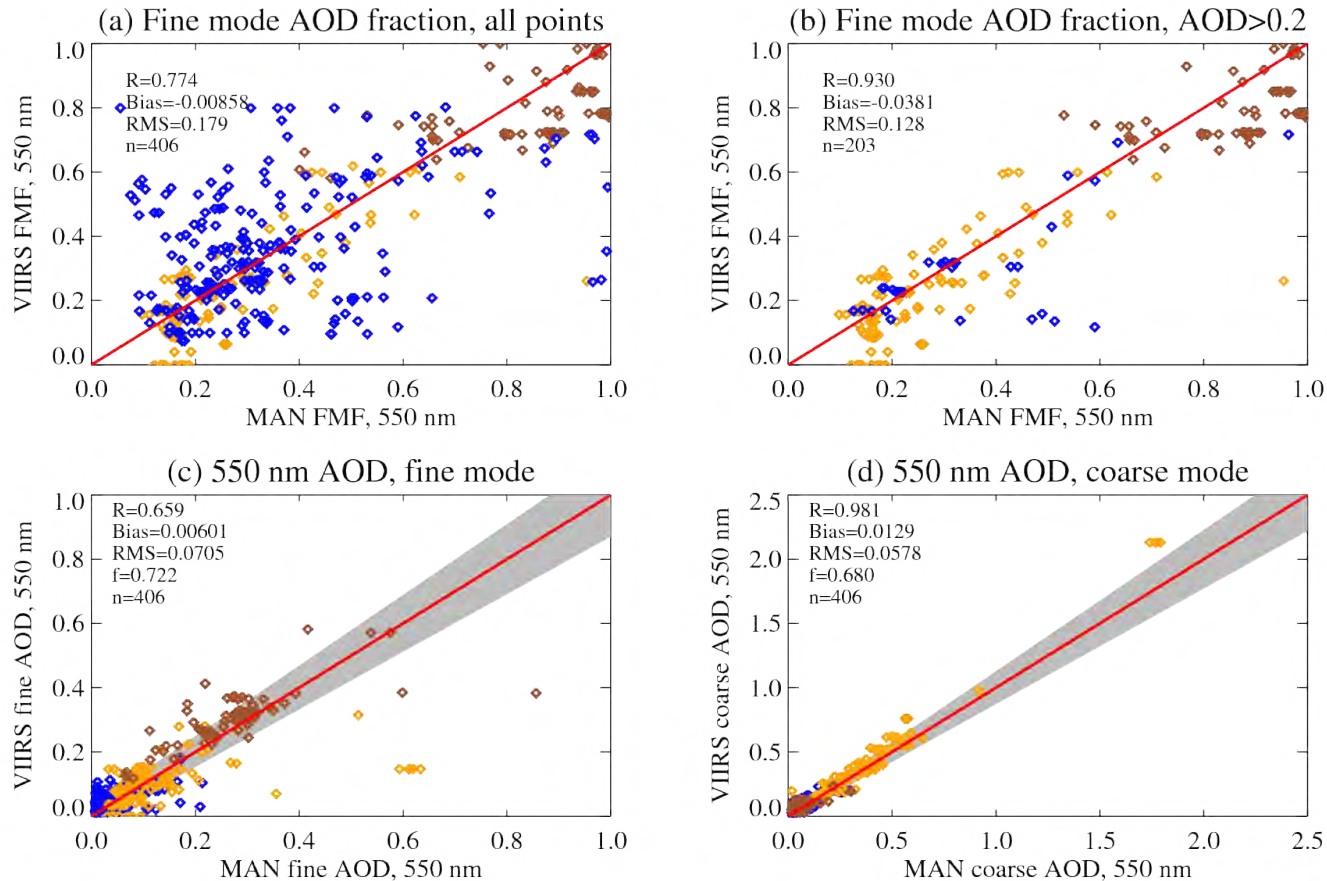


# Validation helps us to quantify uncertainties and their contextual dependence



! Colours indicate aerosol optical model:  
**marine background**, **dust**, or **fine-mode dominated**

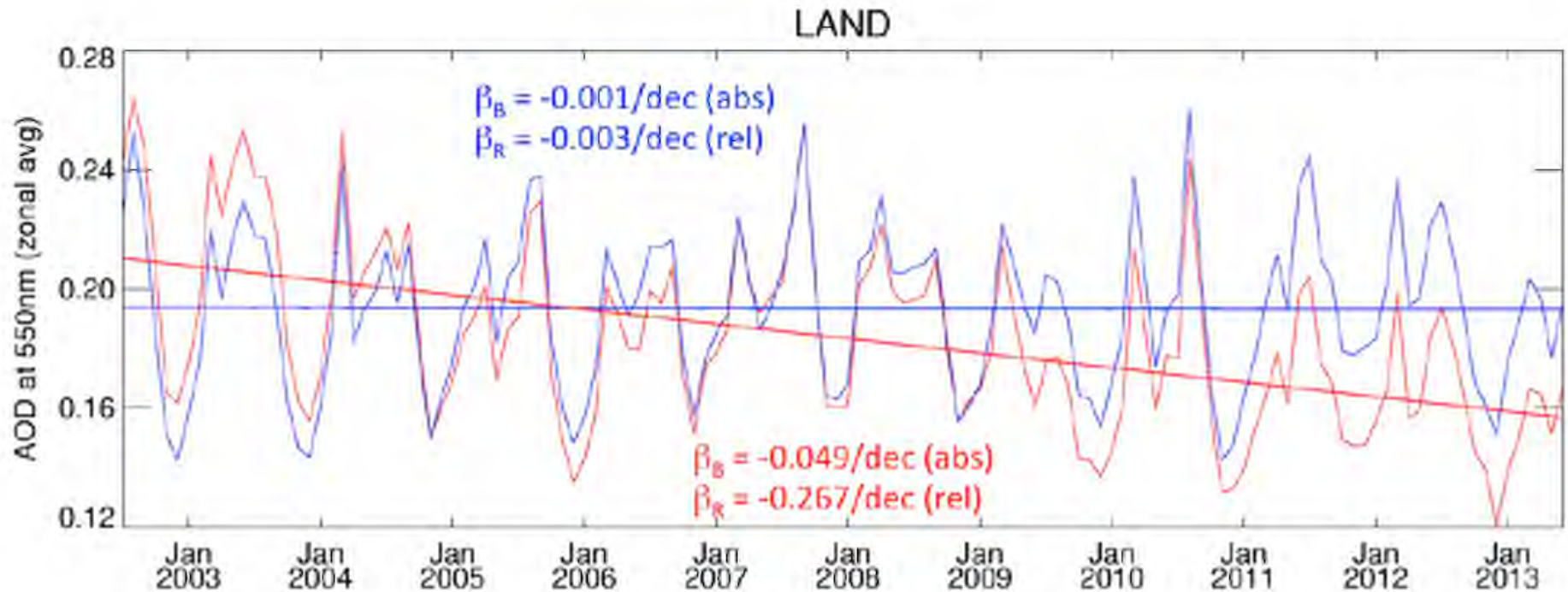
# We can also examine more strongly-derived (as opposed to retrieved) quantities



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**marine background**, **dust**, or **fine-mode dominated**

# Current challenges and new directions

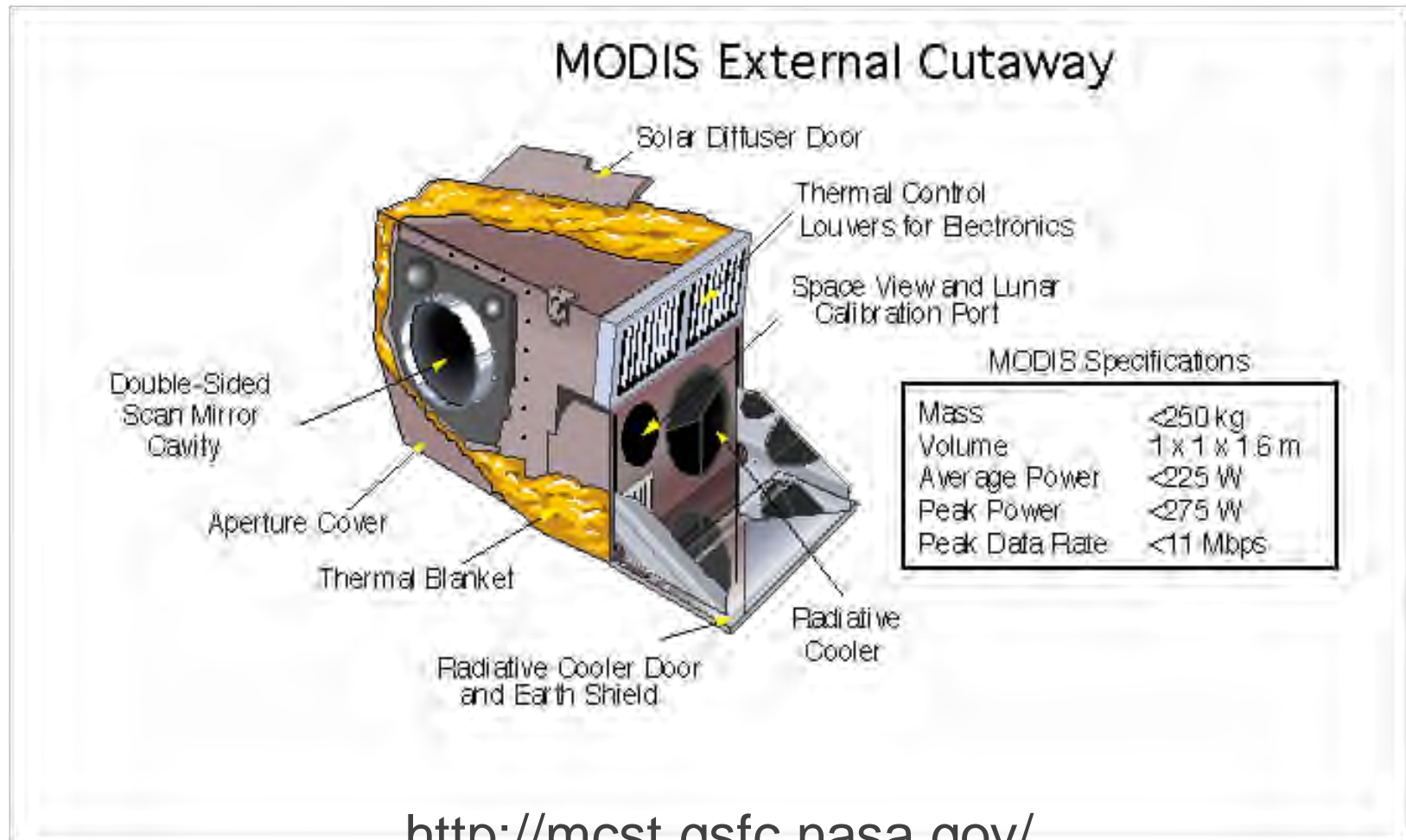
# Calibration monitoring is necessary to ensure a stable, high-quality data set



MODIS Collection 5  
Lyapustin *et al.*, AMT (2014)

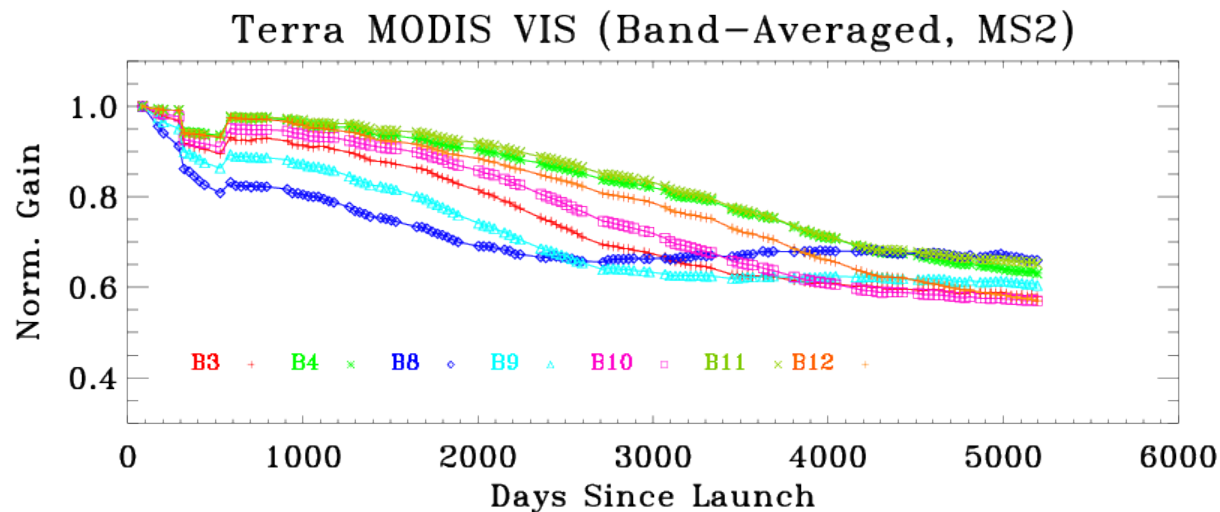
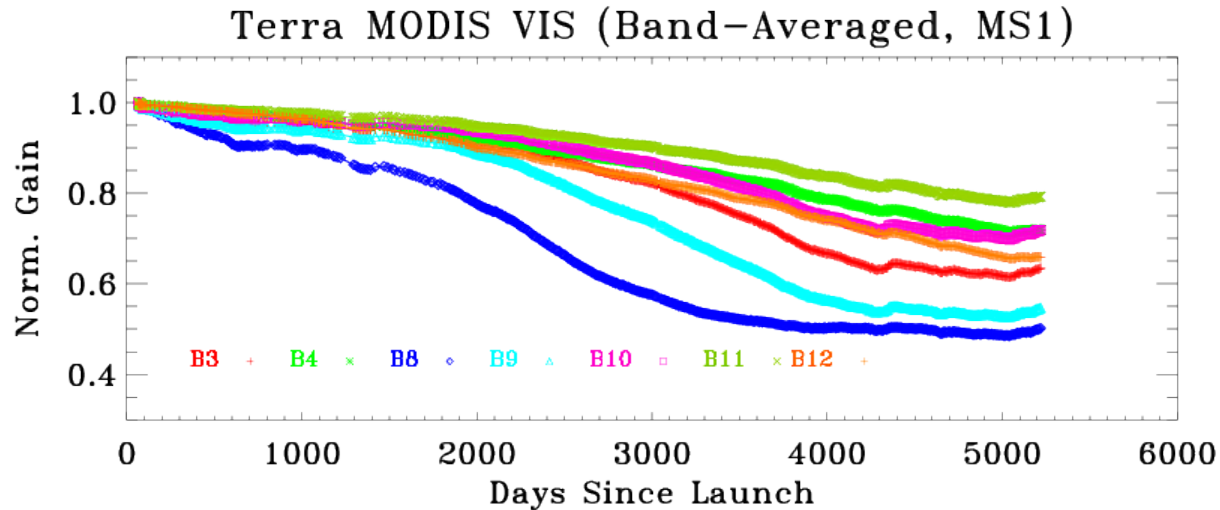


# A lot of effort goes in to maintaining a high-quality sensor calibration

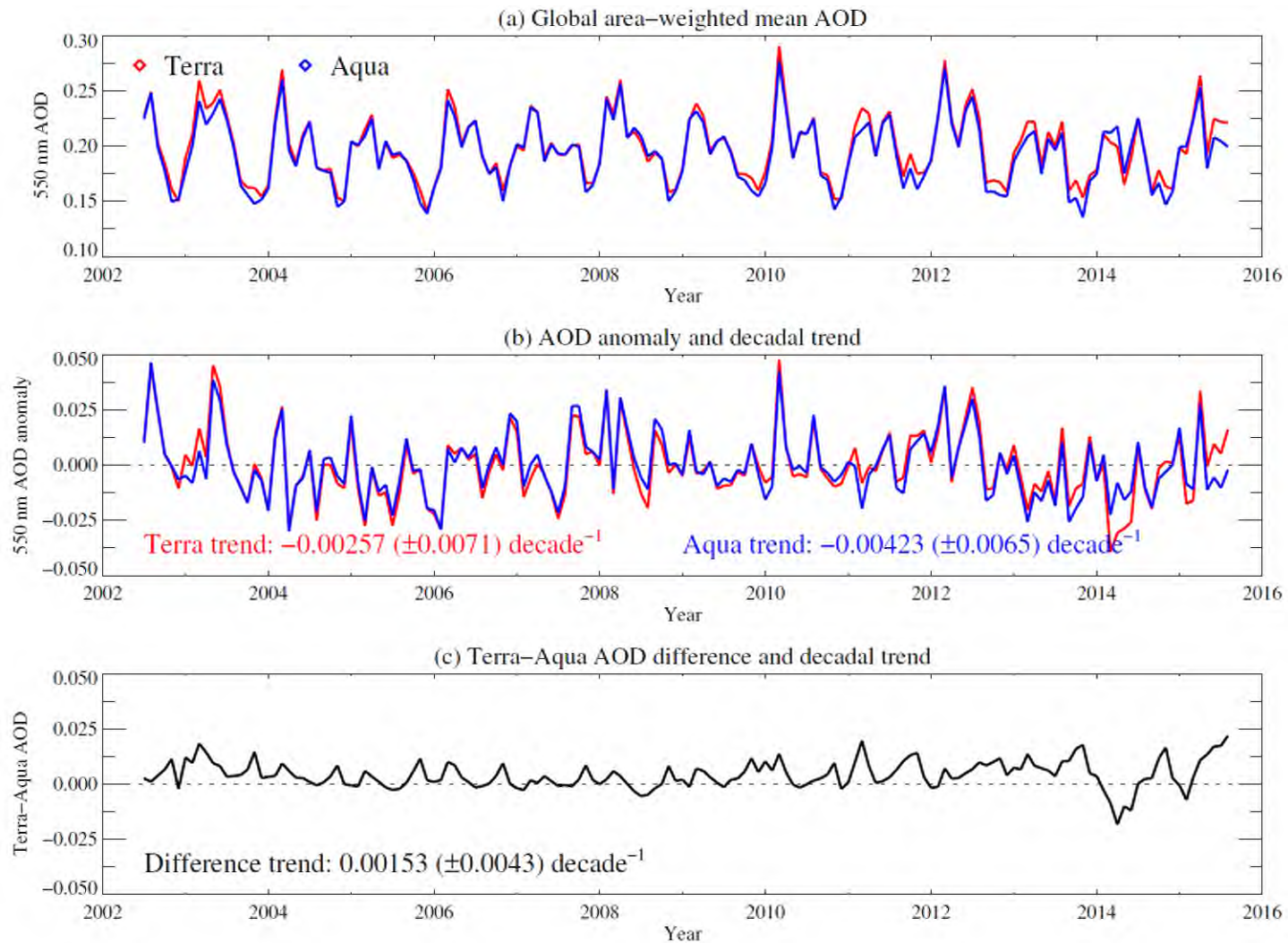




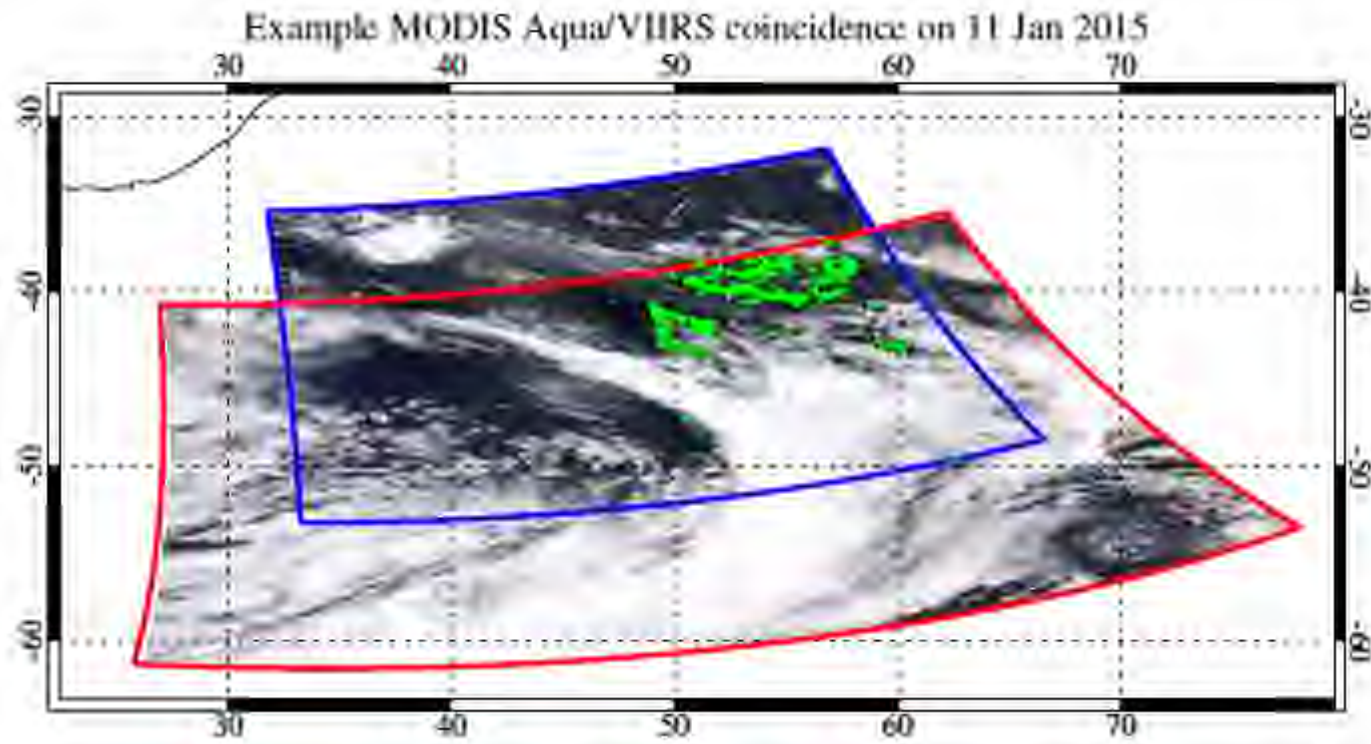
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# The resulting level of consistency is sufficient for most applications

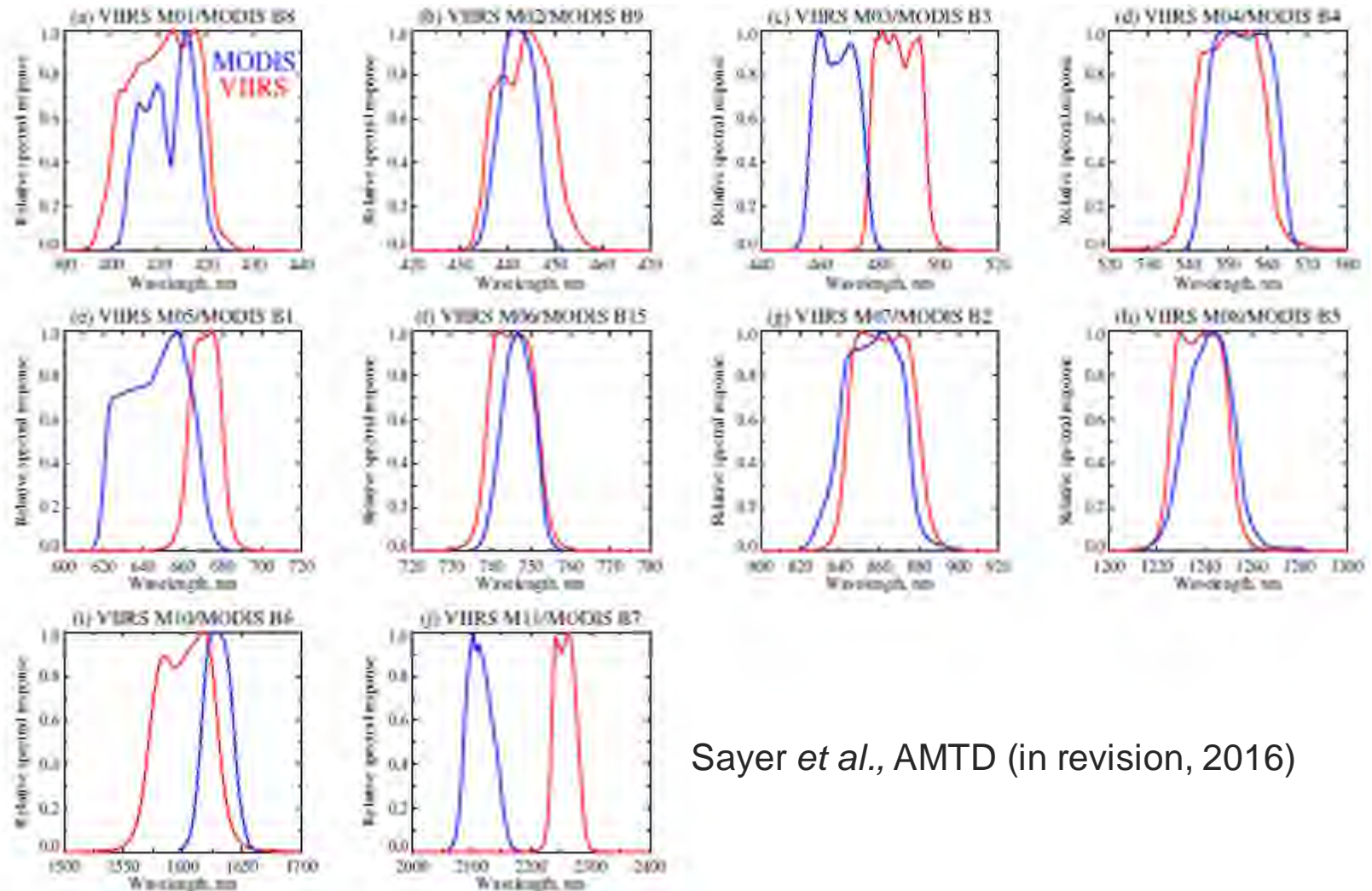


# Sensors can be cross-calibrated to ensure radiometric consistency



Sayer *et al.*, AMTD (in revision, 2016)

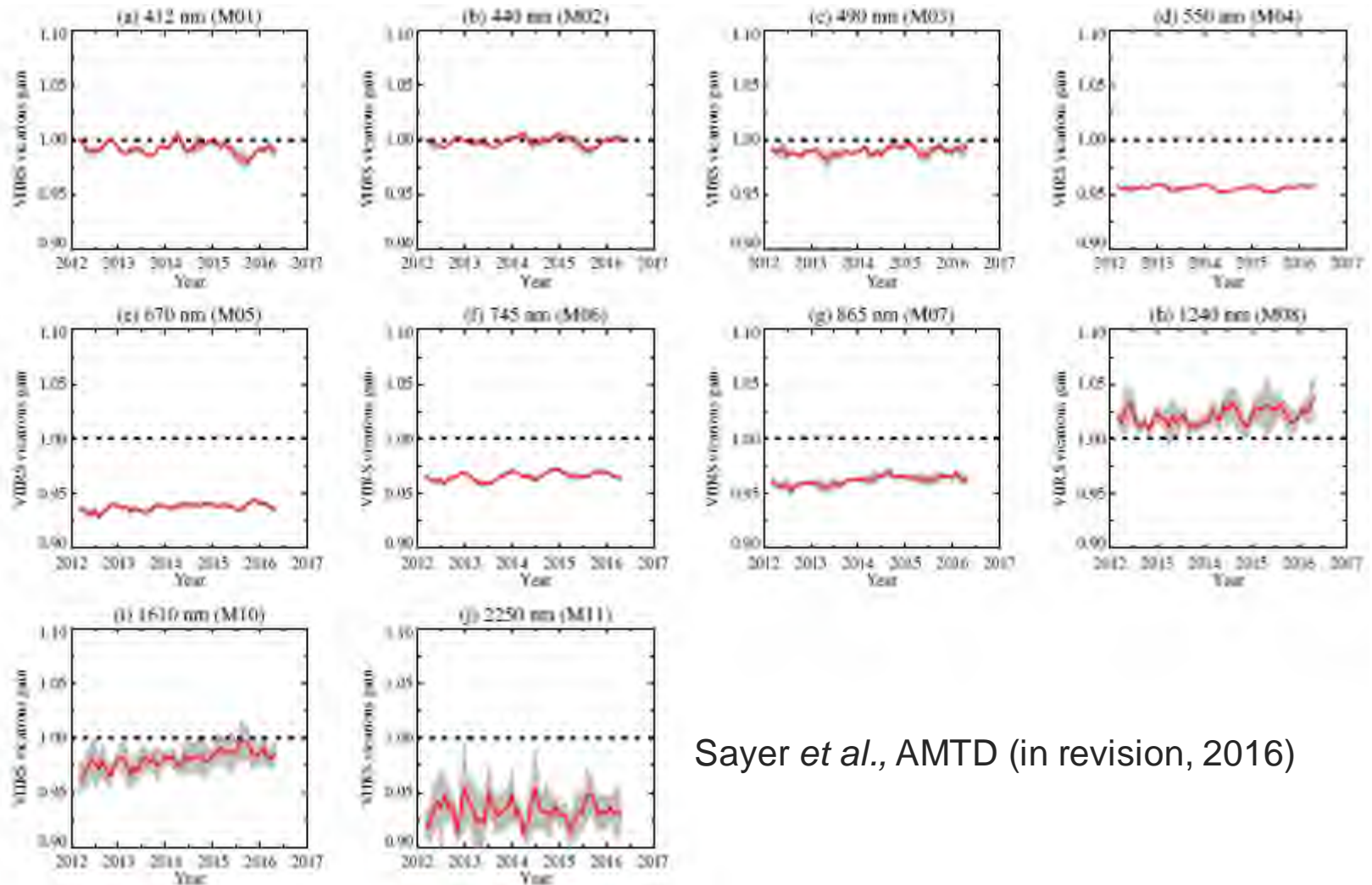
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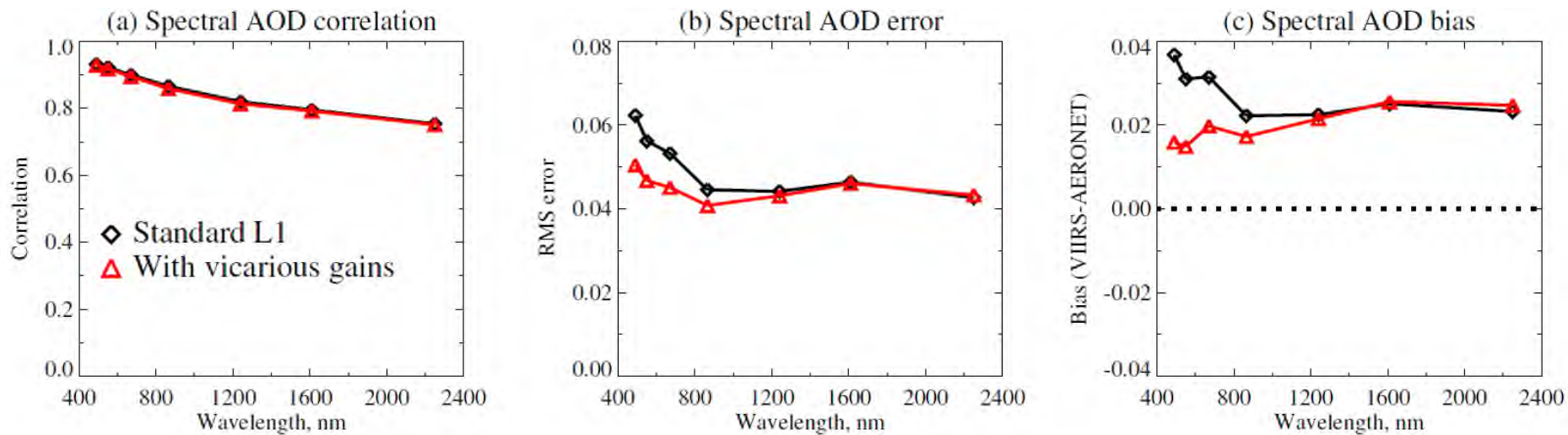


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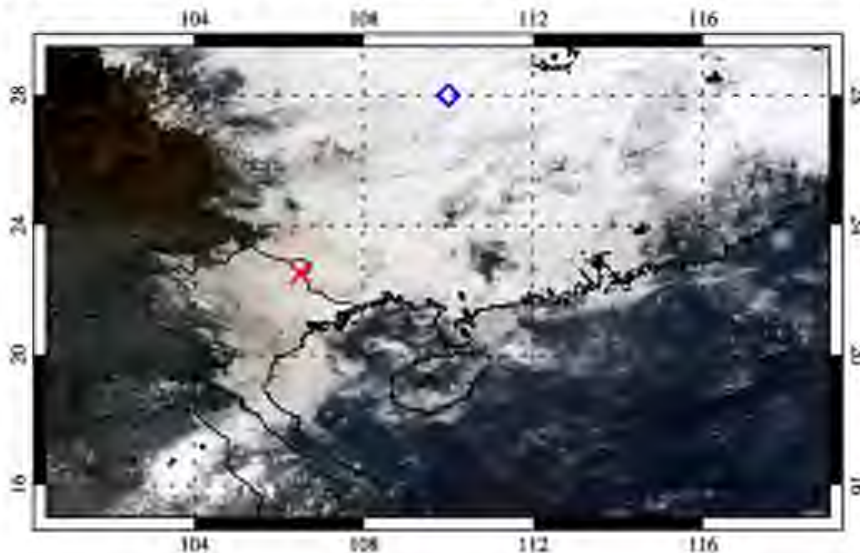
Sayer *et al.*, AMTD (in revision, 2016)





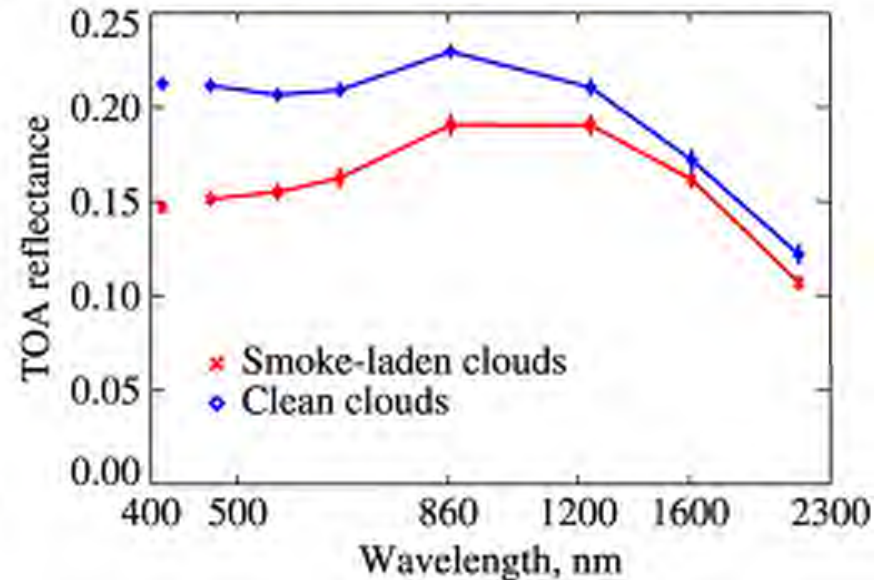
# Can we say something about aerosols above clouds?

(a) MODIS Terra, 03:20 UTC, Mar 14 2015



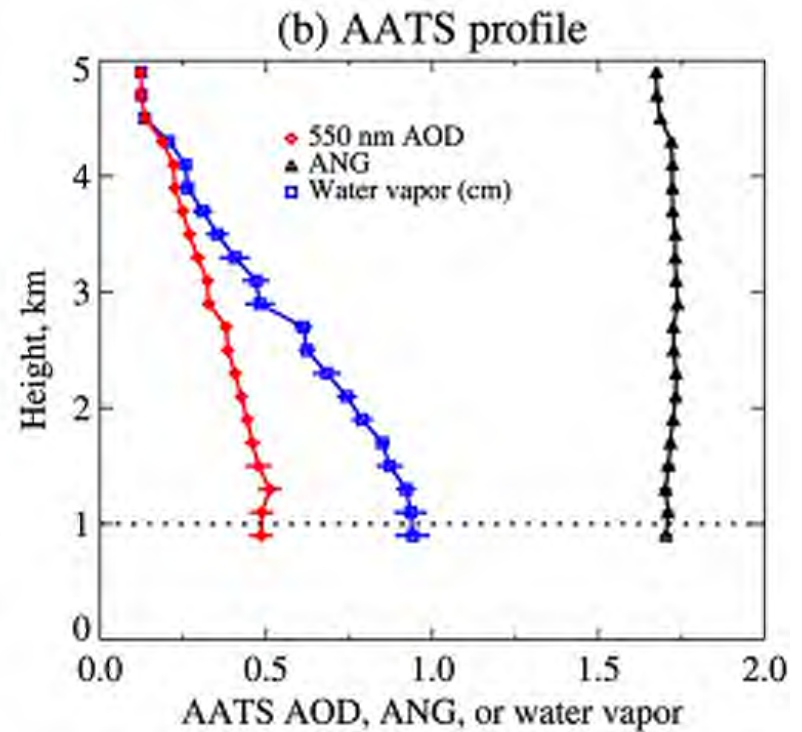
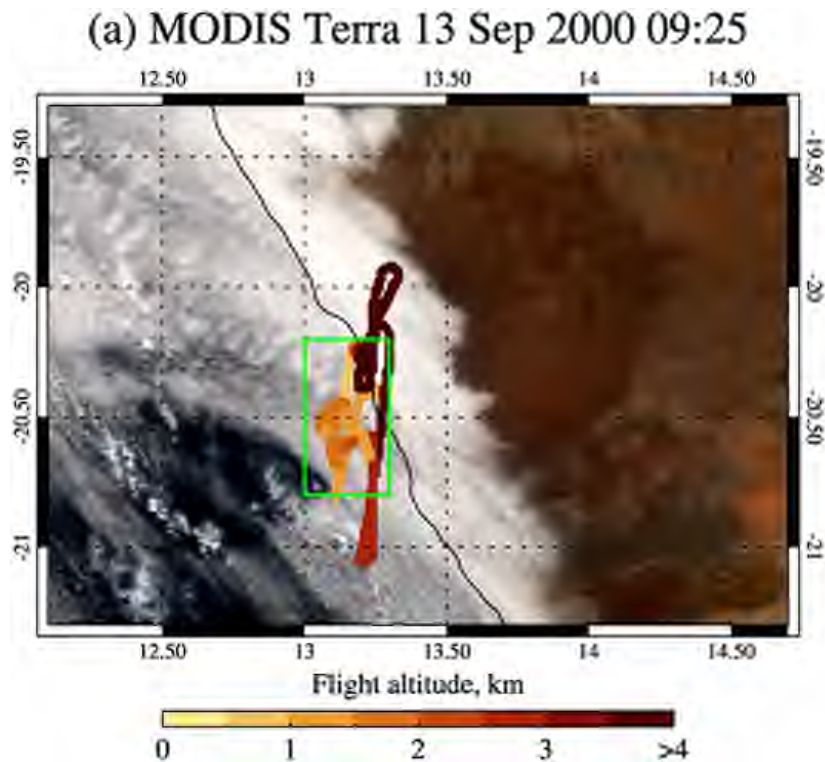
Sayer *et al.*, JGR (2016)

(b) Spectral TOA reflectance



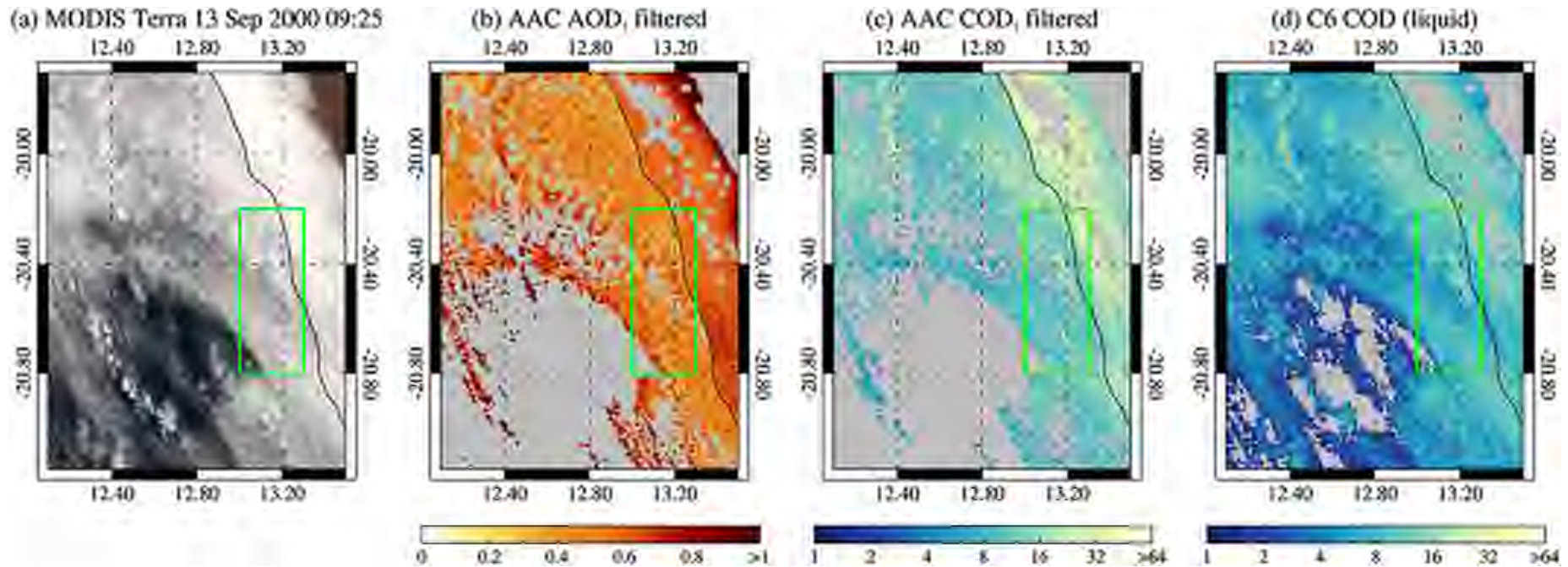
- ! In most cases, aerosols above a land or water surface *brighten* the scene
- ! Light-absorbing aerosols above clouds instead *darken* it
- ! This means that retrievals of cloud properties exhibit *systematic biases* in these cases

Airborne observations are limited,  
but essential to validate this new approach





# Airborne observations are limited, but essential to validate this new approach



- ! Airborne estimate of AOD from cloud-top upwards  $0.49 \pm 0.04$
- ! MODIS-based estimate  $0.51 \pm 0.10$
- ! Difference between retrieved cloud optical depth and standard (no-aerosol) MODIS cloud product consistent with expectations

# There are a lot of opportunities in aerosol science for new researchers

- ! Instrument development
  - " Satellite, ground-based, airborne
  - " Field campaigns
- ! Retrieval algorithm development
  - " Physics, statistics, programming, meteorology are all useful
- ! Laboratory measurements of aerosols
- ! Interdisciplinary research requires a broad range of expertise
  - " Quantitatively linking aerosol loading to air quality and health
  - " Ecosystem response to aerosols
  - " Radiative effects of aerosols
  - " Long-term changes
  - " Diurnal variability
  - " Hazard detection and avoidance